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Health-Assistive Smart Homes with a Clinician-in-the-Loop

Concurrent Scientific Sessions VII

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# **DISCLOSURE(S)**

Research Support: National Institutes of Health (R25EB024327)

**Touchmark Foundation** 

Linblad Foundation

Washington State University

Consultant: None

Discussion of Off-Label, Investigational, or Experimental Drug Use:

None





## Situating the Research







# CASAS Health-Assistive Smart Home

- 1. A home that can perceive its environment through the use of sensors, and can act upon the environment through the use of actuators<sup>1,2</sup>.
- 2. Uses machine learning to identify changes in health states<sup>3,4</sup>.













## **Chronic Illness Study**

#### Purpose:

Add a clinician-in-the-loop for development of a health-assistive smart home

#### **Technology:**

5 'Smart Home in a Box' (SHIBs) deployed

#### **Inclusion Criteria**

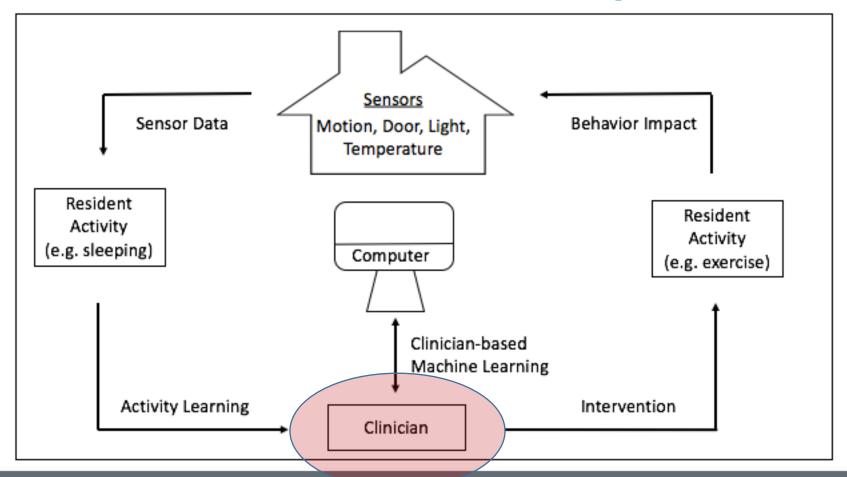
- 55 or over
- > 2 Chronic Illness







## Clinician-in-the-Loop







#### **Clinician Process**

- 1. Organize health information
- 2. Identify measures in the literature
- 3. Identify clinical change in health state
- 4. Verify reliability of data
- 5. Conduct scoped review of sensor data
- 6. Provide clinical interpretation of sensor data to engineers

Nurse provides clinical interpretation of data for training the machine<sup>5</sup>.





# Clinical Interpretation: Qualitative Content Analysis in Quantitative Data

Qualitative Methods	Quantitative Data
Transcripts	Text-based data
Patterns	Motion patterns & daily routines
Themes	Clinically relevant repeated, or stand-out, motion patterns





# **Clinical Findings**

34 total health events were observed and interpreted between November 2016 and June 2017; 18 falls

Wandering

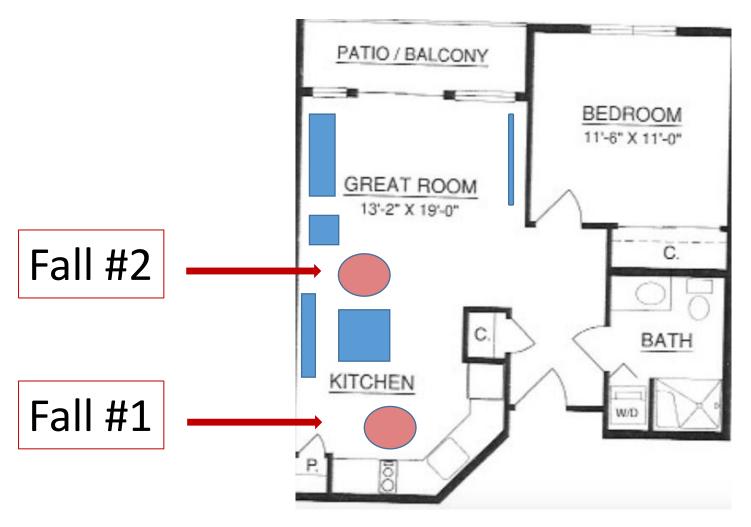
Insomnia

Nocturia Weakness Situational Depression

Medication Side Effect







# SAN FRANCISCO IAGO 2017

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	21:04:45.470087	KitchenADiningChair
	21:04:46.337140	LivingRoomAChair
	21:04:46.590135	KitchenADiningChair
	21:04:46.857620	LivingRoomAArea OFF
	21:10:41.846734	KitchenADiningChair
2017-05-26	21:10:41.90689	KitchenADiningChair

LivingRoomAArea ON
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KitchenADiningChair OFF
KitchenADiningChair OFF
LivingRoomAArea OFF 6 min gap in data here
KitchenADiningChair ON
KitchenADiningChair OFF

#### **TIME**

21:04:46.857620

and

21:10:41.846734





## **Restless Leg Syndrome**

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## **Situational Depression**

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## **Emerging Themes as New Discoveries**

Themes	Characteristics
Room Usage	Wandering: Macro, Micro, Specific Room
Repeated Behavior	Kitchen Sink, Refrigerator, Door
Time Compare (%)	Rest vs. Activity Gap in sensor activations
Walking Speed via Ambient Sensors Only	Night time To bathroom and positon of origin





# **Emerging Themes Continued**

Themes	Characteristics
Sensor Activation Combos	Area sensor, <u>solo</u> Direct sensor, <u>solo</u> Time & length of solo activations
Bookends	Abnormal <u>between</u> normal patterns
On-ramp and Off-ramp Data (Transitions)	Rest and Sleep Bathroom usage Kitchen usage





## **Implications**

Research	Lots of LIMITATIONS!  Method needs further developed  May improve machine learning accuracy
Education	Nurses and future smart technologies
Clinical Practice	May extend reach of nurse Expansion of nursing informatics practice
Health Policy	Privacy concerns





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### **QUESTIONS AND CONTACT INFO**

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